

Virus Proteomz

Introduction

This notebook provides a comprehensive analysis of virus data, showcasing basic to advanced R functionalities. The analysis will cover data import, cleaning, exploratory data analysis (EDA), and advanced statistical methods. The goal is to understand the data better and uncover significant patterns and relationships that can inform further research and decision-making.

Importing data

```
library(readr)
VirusData <- read_csv("pt 2/VirusProteomz.csv")

## Rows: 2649 Columns: 60
## -- Column specification -----
## Delimiter: ","
## chr (42): MS.MS.sample.name, DepthGroup, Region, Peptide.sequence, Protein.n...
## dbl (17): z, Stn, Depth.m., Longitude, Latitude, Exclusive.Sum.PSM, Scaling...
## lgl (1): SOM.Label.Flag
##
## i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.
```

Cleaning the Data

```
# Load necessary libraries
library(dplyr)

## Warning: package 'dplyr' was built under R version 4.4.2

##
## Attaching package: 'dplyr'

## The following objects are masked from 'package:stats':
##
##   filter, lag

## The following objects are masked from 'package:base':
##
##   intersect, setdiff, setequal, union
```

```

library(readr)
VirusData <- read_csv("pt 2/VirusProteomz.csv")

## Rows: 2649 Columns: 60

## -- Column specification -----
## Delimiter: ","
## chr (42): MS.MS.sample.name, DepthGroup, Region, Peptide.sequence, Protein.n...
## dbl (17): z, Stn, Depth.m., Longitude, Latitude, Exclusive.Sum.PSM, Scaling_...
## lgl (1): SOM.Label.Flag
##
## i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.

# 1. Remove rows with missing values
cleaned_data <- VirusData %>%
  na.omit()

# 2. Filter out outliers (example: removing rows where 'value' column is outside 1.5*IQR)
Q1 <- quantile(cleaned_data$value, 0.25)

## Warning: Unknown or uninitialised column: 'value'.

Q3 <- quantile(cleaned_data$value, 0.75)

## Warning: Unknown or uninitialised column: 'value'.

IQR <- Q3 - Q1

# 3. Normalize the data (example: scaling 'value' column between 0 and 1)
cleaned_data <- cleaned_data %>%
  mutate(value = (60 - min(0)) / (max(60) - min(0)))

# View the cleaned data
head(cleaned_data)

## # A tibble: 0 x 61
## # i 61 variables: z <dbl>, MS.MS.sample.name <chr>, Stn <dbl>, Depth.m. <dbl>,
## # Longitude <dbl>, Latitude <dbl>, DepthGroup <chr>, Region <chr>,
## # Peptide.sequence <chr>, Protein.name <chr>, Exclusive.Sum.PSM <dbl>,
## # Scaling_Factor <dbl>, Calculated.Total.Protein..ug.L. <dbl>,
## # Scaled.Corrected.Exclusive.Sum <dbl>, blast.accession <chr>,
## # blast.best.hit.taxon.id <dbl>, KO <chr>, Group <chr>, Domain <chr>,
## # Phylum <chr>, Class <chr>, Order <chr>, Family <chr>, Genus <chr>, ...

```

Basic Exploration: Examine data dimensions and structure.

Check the structure of the data

```
str(VirusData)
```

```
## spc_tbl_ [2,649 x 60] (S3: spec_tbl_df/tbl_df/tbl/data.frame)
## $ z : num [1:2649] 1 2 3 4 5 6 7 8 9 10 ...
## $ MS.MS.sample.name : chr [1:2649] "170825_proteOMZ_2D_st10_1" "170825_proteOMZ_2D_st10_2" ...
## $ Stn : num [1:2649] 10 10 10 10 10 10 10 10 10 10 ...
## $ Depth.m. : num [1:2649] 20 20 20 20 20 20 20 20 20 20 ...
## $ Longitude : num [1:2649] -140 -140 -140 -140 -140 -140 -140 -140 -140 -140 ...
## $ Latitude : num [1:2649] 8 8 8 8 8 8 8 8 8 8 ...
## $ DepthGroup : chr [1:2649] "Surface" "Surface" "Surface" "Surface" ...
## $ Region : chr [1:2649] "South" "South" "South" "South" ...
## $ Peptide.sequence : chr [1:2649] "AAPFQNYSGGVLLADIVK" "ADNVLDNIGAIAGPFR" "ADNVLDNIGAIAGPFR" ...
## $ Protein.name : chr [1:2649] "NODE_28185_length_2191_cov_2.93493_1078_2191" "NODE_28185_length_2191_cov_2.93493_1078_2191" ...
## $ Exclusive.Sum.PSM : num [1:2649] 6 1 1 1 2 1 1 2 1 1 ...
## $ Scaling_Factor : num [1:2649] 2.54 2.54 2.54 2.54 2.54 2.54 2.54 2.54 2.54 ...
## $ Calculated.Total.Protein..ug.L. : num [1:2649] 7.7 7.7 7.7 7.7 7.7 7.7 7.7 7.7 7.7 ...
## $ Scaled.Corrected.Exclusive.Sum : num [1:2649] 23.53 3.92 3.92 3.92 3.92 3.92 3.92 3.92 3.92 ...
## $ blast.accession : chr [1:2649] "BAR38595.1" "ANS04856.1" "YP_004322545.1" "YP_004322545.1" ...
## $ blast.best.hit.taxon.id : num [1:2649] 1407671 1868660 445700 1407671 1262072 1262072 1262072 1262072 1262072 ...
## $ KO : chr [1:2649] NA NA NA NA ...
## $ Group : chr [1:2649] "Viruses" "Viruses" "Viruses" "Viruses" "Viruses" ...
## $ Domain : chr [1:2649] "Viruses" "Viruses" "Viruses" "Viruses" "Viruses" ...
## $ Phylum : chr [1:2649] "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" ...
## $ Class : chr [1:2649] "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" ...
## $ Order : chr [1:2649] "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" ...
## $ Family : chr [1:2649] "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" ...
## $ Genus : chr [1:2649] "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" ...
## $ Species : chr [1:2649] "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" ...
## $ LCA.Group : chr [1:2649] "Viruses" "Viruses" "Viruses" "Viruses" "Viruses" ...
## $ LCA.Domain : chr [1:2649] "Viruses" "Viruses" "Viruses" "Viruses" "Viruses" ...
## $ LCA.Phylum : chr [1:2649] "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" ...
## $ LCA.Class : chr [1:2649] "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" ...
## $ LCA.Order : chr [1:2649] "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" ...
## $ LCA.Family : chr [1:2649] "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" ...
## $ LCA.Genus : chr [1:2649] "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" ...
## $ LCA.Level : chr [1:2649] "Species" "Class" "Species" "Species" "Species" ...
## $ LCA.taxon : chr [1:2649] "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" ...
## $ Combo.Group : chr [1:2649] "Viruses" "Viruses" "Viruses" "Viruses" "Viruses" ...
## $ Combo.Domain : chr [1:2649] "Viruses" "Viruses" "Viruses" "Viruses" "Viruses" ...
## $ Combo.Phylum : chr [1:2649] "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" ...
## $ Combo.Class : chr [1:2649] "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" "Unclassified Viruses" ...
## $ Combo.Order : chr [1:2649] "Unclassified Viruses" "Caudovirales|Unclassified Viruses" "Caudovirales|Unclassified Viruses" ...
## $ Combo.Family : chr [1:2649] "Unclassified Viruses" "Myoviridae|Unclassified Viruses" "Myoviridae|Unclassified Viruses" ...
## $ Combo.Genus : chr [1:2649] "Unclassified Viruses" "Unclassified Myoviridae" "Unclassified Myoviridae" "Unclassified Myoviridae" ...
## $ Combo.KO : chr [1:2649] NA NA NA NA ...
## $ Combo.KO.Orthology : chr [1:2649] NA NA NA NA ...
## $ Combo.KO.Class : chr [1:2649] NA NA NA NA ...
## $ Combo.KO.Path : chr [1:2649] NA NA NA NA ...
## $ Combo.Gene.Name : chr [1:2649] NA NA NA NA ...
## $ Combo.Gene.Description : chr [1:2649] NA NA NA NA ...
## $ Combo.E.C. : chr [1:2649] NA NA NA NA ...
## $ Best.Peptide.identification.probability: chr [1:2649] "99.70%" "99.40%" "99.70%" "99.70%" ...
## $ Best.Sequest..XCorr.Only..deltaCn : num [1:2649] 0.474 0.455 0.364 0.216 0.47 0.519 0.464 0.464 0.464 ...
```

```

## $ Best.Sequest..XCorr.Only..XCorr      : num [1:2649] 4.32 3.56 4.31 4.93 5.06 6.39 4.21 4.2 3.6 ...
## $ Number.of.identified..2H.spectra     : num [1:2649] 4 1 1 0 2 1 1 2 1 1 ...
## $ Number.of.identified..3H.spectra     : num [1:2649] 2 0 0 1 0 0 0 0 0 0 ...
## $ Number.of.identified..4H.spectra     : num [1:2649] 0 0 0 0 0 0 0 0 0 0 ...
## $ Median.Retention.Time                : num [1:2649] 20517 17785 6518 7948 14682 ...
## $ Total.TIC                           : num [1:2649] 488096 28477 102219 152687 218726 ...
## $ SOM.Label                           : chr [1:2649] "Unclassified Viruses" "Unclassified Viruses" ...
## $ SOM.Label.Flag                       : logi [1:2649] NA NA NA NA NA NA ...
## $ All.Other.Proteins                   : chr [1:2649] "[ 'NODE_2626827_length_245_cov_1_1_239_+',
## $ StnDepth                             : chr [1:2649] "10_20" "10_20" "10_20" "10_20" ...
## - attr(*, "spec")=
## .. cols(
## ..   z = col_double(),
## ..   MS.MS.sample.name = col_character(),
## ..   Stn = col_double(),
## ..   Depth.m. = col_double(),
## ..   Longitude = col_double(),
## ..   Latitude = col_double(),
## ..   DepthGroup = col_character(),
## ..   Region = col_character(),
## ..   Peptide.sequence = col_character(),
## ..   Protein.name = col_character(),
## ..   Exclusive.Sum.PSM = col_double(),
## ..   Scaling_Factor = col_double(),
## ..   Calculated.Total.Protein..ug.L. = col_double(),
## ..   Scaled.Corrected.Exclusive.Sum = col_double(),
## ..   blast.accession = col_character(),
## ..   blast.best.hit.taxon.id = col_double(),
## ..   KO = col_character(),
## ..   Group = col_character(),
## ..   Domain = col_character(),
## ..   Phylum = col_character(),
## ..   Class = col_character(),
## ..   Order = col_character(),
## ..   Family = col_character(),
## ..   Genus = col_character(),
## ..   Species = col_character(),
## ..   LCA.Group = col_character(),
## ..   LCA.Domain = col_character(),
## ..   LCA.Phylum = col_character(),
## ..   LCA.Class = col_character(),
## ..   LCA.Order = col_character(),
## ..   LCA.Family = col_character(),
## ..   LCA.Genus = col_character(),
## ..   LCA.Level = col_character(),
## ..   LCA.taxon = col_character(),
## ..   Combo.Group = col_character(),
## ..   Combo.Domain = col_character(),
## ..   Combo.Phylum = col_character(),
## ..   Combo.Class = col_character(),
## ..   Combo.Order = col_character(),
## ..   Combo.Family = col_character(),
## ..   Combo.Genus = col_character(),
## ..   Combo.KO = col_character(),

```

```
## .. Combo.KO.Orthology = col_character(),
## .. Combo.KO.Class = col_character(),
## .. Combo.KO.Path = col_character(),
## .. Combo.Gene.Name = col_character(),
## .. Combo.Gene.Description = col_character(),
## .. Combo.E.C. = col_character(),
## .. Best.Peptide.identification.probability = col_character(),
## .. Best.Sequest.XCorr.Only..deltaCn = col_double(),
## .. Best.Sequest.XCorr.Only..XCorr = col_double(),
## .. Number.of.identified..2H.spectra = col_double(),
## .. Number.of.identified..3H.spectra = col_double(),
## .. Number.of.identified..4H.spectra = col_double(),
## .. Median.Retention.Time = col_double(),
## .. Total.TIC = col_double(),
## .. SOM.Label = col_character(),
## .. SOM.Label.Flag = col_logical(),
## .. All.Other.Proteins = col_character(),
## .. StnDepth = col_character()
## .. )
## - attr(*, "problems")=<externalptr>
```

Get a summary of each column

```
summary(VirusData)
```

```
##           z           MS.MS.sample.name           Stn           Depth.m.
## Min.      : 1      Length:2649      Min.      : 4.00      Min.      : 20.0
## 1st Qu.: 663      Class :character      1st Qu.: 8.00      1st Qu.: 60.0
## Median :1325      Mode  :character      Median :11.00      Median : 80.0
## Mean    :1325                                Mean  :10.04      Mean   : 157.5
## 3rd Qu.:1987                                3rd Qu.:12.00      3rd Qu.: 200.0
## Max.    :2649                                Max.   :14.00      Max.   :1250.0
##
##      Longitude      Latitude      DepthGroup      Region
## Min.    :-156.0      Min.     :-10.600      Length:2649      Length:2649
## 1st Qu. :-146.3      1st Qu.  :-4.200      Class :character      Class :character
## Median  :-140.0      Median   : 4.000      Mode  :character      Mode  :character
## Mean    :-143.7      Mean     : 2.896
## 3rd Qu. :-140.0      3rd Qu.  :10.000
## Max.    :-139.8      Max.     :10.000
## NA's    :24          NA's      :24
## Peptide.sequence      Protein.name      Exclusive.Sum.PSM      Scaling_Factor
## Length:2649           Length:2649           Min.      : 0.000      Min.      :1.000
## Class :character      Class :character      1st Qu.: 1.000      1st Qu.:1.990
## Mode  :character      Mode  :character      Median : 1.000      Median :2.906
##                                     Mean  : 1.645      Mean   :2.834
##                                     3rd Qu.: 2.000      3rd Qu.:3.374
##                                     Max.   :12.000      Max.   :5.388
##
## Calculated.Total.Protein..ug.L.      Scaled.Corrected.Exclusive.Sum
## Min.      : 0.500                      Min.      : 0.000
## 1st Qu.: 2.663                      1st Qu.: 1.361
```

```

## Median : 7.910                      Median : 5.638
## Mean   : 7.617                      Mean   : 7.962
## 3rd Qu.:10.537                     3rd Qu.: 9.736
## Max.    :17.846                     Max.    :137.258
##
## blast.accession    blast.best.hit.taxon.id    KO
## Length:2649        Min.      : 44088          Length:2649
## Class :character    1st Qu.: 455364          Class :character
## Mode  :character    Median :1407671          Mode  :character
##                               Mean  :1146946
##                               3rd Qu.:1499987
##                               Max.   :2283265
##
##      Group          Domain          Phylum          Class
## Length:2649        Length:2649        Length:2649        Length:2649
## Class :character    Class :character    Class :character    Class :character
## Mode  :character    Mode  :character    Mode  :character    Mode  :character
##
##
##
##      Order          Family          Genus          Species
## Length:2649        Length:2649        Length:2649        Length:2649
## Class :character    Class :character    Class :character    Class :character
## Mode  :character    Mode  :character    Mode  :character    Mode  :character
##
##
##
##      LCA.Group      LCA.Domain      LCA.Phylum      LCA.Class
## Length:2649        Length:2649        Length:2649        Length:2649
## Class :character    Class :character    Class :character    Class :character
## Mode  :character    Mode  :character    Mode  :character    Mode  :character
##
##
##
##      LCA.Order      LCA.Family      LCA.Genus      LCA.Level
## Length:2649        Length:2649        Length:2649        Length:2649
## Class :character    Class :character    Class :character    Class :character
## Mode  :character    Mode  :character    Mode  :character    Mode  :character
##
##
##
##      LCA.taxon      Combo.Group      Combo.Domain      Combo.Phylum
## Length:2649        Length:2649        Length:2649        Length:2649
## Class :character    Class :character    Class :character    Class :character
## Mode  :character    Mode  :character    Mode  :character    Mode  :character
##
##
##
##      Combo.Class      Combo.Order      Combo.Family      Combo.Genus

```

```

## Length:2649      Length:2649      Length:2649      Length:2649
## Class :character  Class :character  Class :character  Class :character
## Mode :character   Mode :character   Mode :character   Mode :character
##
##
##
## Combo.K0          Combo.K0.Orthology  Combo.K0.Class     Combo.K0.Path
## Length:2649      Length:2649      Length:2649      Length:2649
## Class :character  Class :character  Class :character  Class :character
## Mode :character   Mode :character   Mode :character   Mode :character
##
##
##
## Combo.Gene.Name    Combo.Gene.Description  Combo.E.C.
## Length:2649      Length:2649      Length:2649
## Class :character  Class :character      Class :character
## Mode :character   Mode :character      Mode :character
##
##
##
## Best.Peptide.identification.probability Best.Sequest..XCorr.Only..deltaCn
## Length:2649      Min. :0.1220
## Class :character  1st Qu.:0.3630
## Mode :character   Median :0.4240
##                  Mean :0.4232
##                  3rd Qu.:0.4870
##                  Max. :0.6980
##                  NA's :24
## Best.Sequest..XCorr.Only..XCorr Number.of.identified..2H.spectra
## Min. :2.610      Min. : 0.000
## 1st Qu.:3.770      1st Qu.: 1.000
## Median :4.120      Median : 1.000
## Mean :4.239      Mean : 1.234
## 3rd Qu.:4.560      3rd Qu.: 1.000
## Max. :9.000      Max. :12.000
## NA's :24      NA's :24
## Number.of.identified..3H.spectra Number.of.identified..4H.spectra
## Min. :0.0000      Min. :0.000000
## 1st Qu.:0.0000      1st Qu.:0.000000
## Median :0.0000      Median :0.000000
## Mean :0.4038      Mean :0.009905
## 3rd Qu.:1.0000      3rd Qu.:0.000000
## Max. :9.0000      Max. :3.000000
## NA's :24      NA's :24
## Median.Retention.Time Total.TIC      SOM.Label      SOM.Label.Flag
## Min. : 450.4      Min. : 1217      Length:2649      Mode:logical
## 1st Qu.: 8594.3      1st Qu.: 19746      Class :character  NA's:2649
## Median :13868.8      Median : 39488      Mode :character
## Mean :14204.7      Mean : 111382
## 3rd Qu.:19559.3      3rd Qu.: 87417
## Max. :26979.3      Max. :3060900

```

```
## NA's :24          NA's :24
## All.Other.Proteins StnDepth
## Length:2649      Length:2649
## Class :character  Class :character
## Mode :character   Mode :character
##
##
##
##
```

Creating vectors

```
virus_vector <- c(1, 2, 3, 4, 5)
```

Data frame and Vectors

```
VirusData <- c("Myoviridae", "Phycodnaviridae", "Podoviridae")
new_vector <- VirusData[-c(2, 5)]
```

```
VirusData <- data.frame(VirusName = c("Myoviridae", "Phycodnaviridae",
"Podoviridae", "Mimiviridae", "Siphoviridae"), Depth.m. = c(20, 80, 150, 300, 500)
)
exists("Depth_.m.")
```

```
## [1] FALSE
```

```
Depth_.m. <- c(20, 80 , 150, 300, 500)
```

```
VirusData <- Depth_.m.[-c(1,2)]
print(VirusData)
```

```
## [1] 150 300 500
```

Exploratory Data Analysis (EDA)

Relationship between Scaling_Factor and Exclusive.Sum.PSM

```
library(ggplot2)
library(dplyr)
VirusData <- read_csv("pt 2/VirusProteomz.csv")
```

```
## Rows: 2649 Columns: 60
## -- Column specification -----
## Delimiter: ","
```

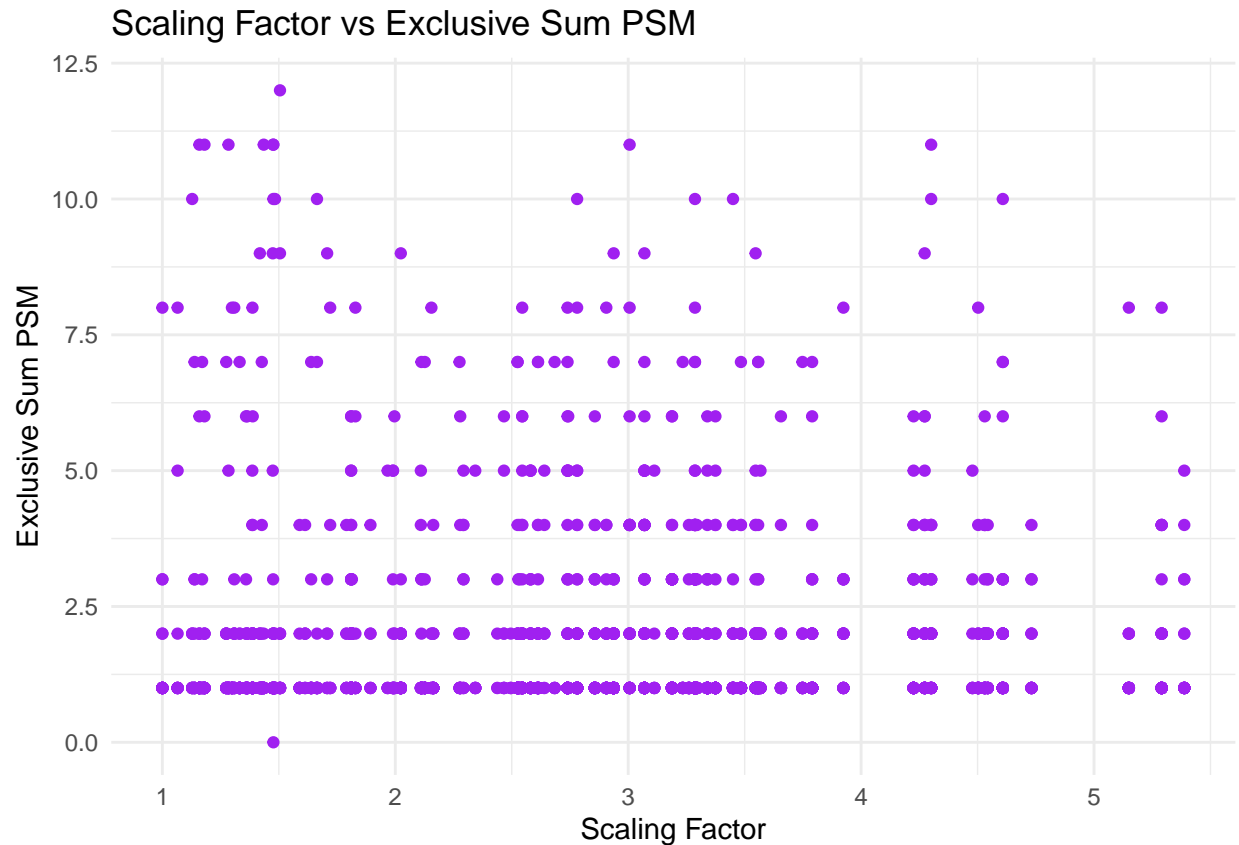


```
## chr (42): MS.MS.sample.name, DepthGroup, Region, Peptide.sequence, Protein.n...
## dbl (17): z, Stn, Depth.m., Longitude, Latitude, Exclusive.Sum.PSM, Scaling_...
## lgl (1): SOM.Label.Flag
##
## i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.
```

```
head(VirusData)
```

```
## # A tibble: 6 x 60
##       z MS.MS.sample.name      Stn Depth.m. Longitude Latitude DepthGroup Region
##   <dbl> <chr>                <dbl>   <dbl>    <dbl>    <dbl> <chr>    <chr>
## 1     1 170825_proteOMZ_2D_~     10     20    -140      8 Surface  South
## 2     2 170825_proteOMZ_2D_~     10     20    -140      8 Surface  South
## 3     3 170825_proteOMZ_2D_~     10     20    -140      8 Surface  South
## 4     4 170825_proteOMZ_2D_~     10     20    -140      8 Surface  South
## 5     5 170825_proteOMZ_2D_~     10     20    -140      8 Surface  South
## 6     6 170825_proteOMZ_2D_~     10     20    -140      8 Surface  South
## # i 52 more variables: Peptide.sequence <chr>, Protein.name <chr>,
## # Exclusive.Sum.PSM <dbl>, Scaling_Factor <dbl>,
## # Calculated.Total.Protein..ug.L. <dbl>,
## # Scaled.Corrected.Exclusive.Sum <dbl>, blast.accession <chr>,
## # blast.best.hit.taxon.id <dbl>, KO <chr>, Group <chr>, Domain <chr>,
## # Phylum <chr>, Class <chr>, Order <chr>, Family <chr>, Genus <chr>,
## # Species <chr>, LCA.Group <chr>, LCA.Domain <chr>, LCA.Phylum <chr>, ...
```

```
ggplot(VirusData, aes(x = Scaling_Factor, y = Exclusive.Sum.PSM)) +
  geom_point(color = "purple") +
  labs(title = "Scaling Factor vs Exclusive Sum PSM", x = "Scaling Factor", y = "Exclusive Sum PSM") +
  theme_minimal()
```



Histogram: To visualize distribution of a variable.

```
library(ggplot2)
library(dplyr)
VirusData <- read_csv("pt 2/VirusProteomz.csv")

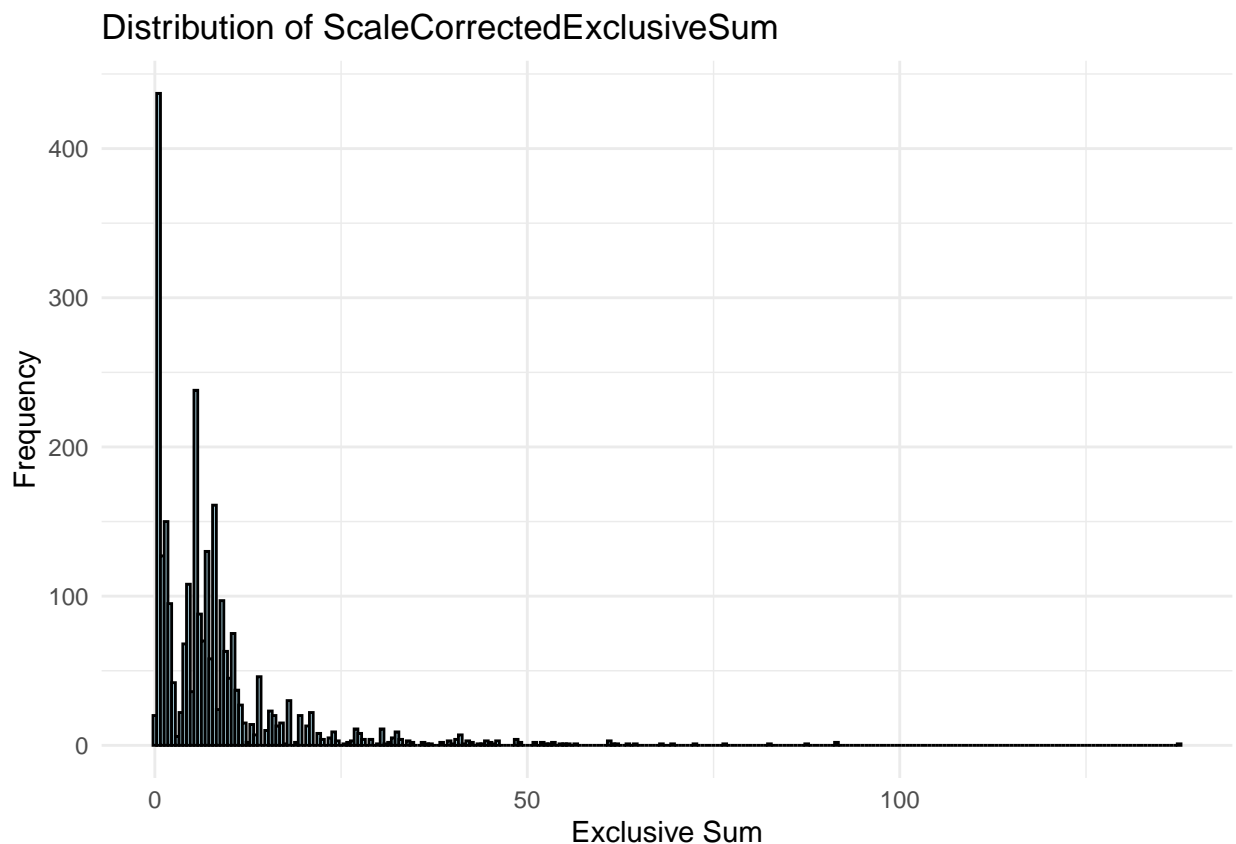
## Rows: 2649 Columns: 60
## -- Column specification -----
## Delimiter: ","
## chr (42): MS.MS.sample.name, DepthGroup, Region, Peptide.sequence, Protein.n...
## dbl (17): z, Stn, Depth.m., Longitude, Latitude, Exclusive.Sum.PSM, Scaling...
## lgl (1): SOM.Label.Flag
##
## i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.
```

```
head(VirusData)
```

```
## # A tibble: 6 x 60
##       z MS.MS.sample.name      Stn Depth.m. Longitude Latitude DepthGroup Region
##   <dbl> <chr>                <dbl>   <dbl>    <dbl>    <dbl> <chr>    <chr>
## 1     1 170825_proteOMZ_2D_~     10     20    -140         8 Surface  South
```

```
## 2      2 170825_proteOMZ_2D_~      10      20      -140      8 Surface      South
## 3      3 170825_proteOMZ_2D_~      10      20      -140      8 Surface      South
## 4      4 170825_proteOMZ_2D_~      10      20      -140      8 Surface      South
## 5      5 170825_proteOMZ_2D_~      10      20      -140      8 Surface      South
## 6      6 170825_proteOMZ_2D_~      10      20      -140      8 Surface      South
## # i 52 more variables: Peptide.sequence <chr>, Protein.name <chr>,
## #   Exclusive.Sum.PSM <dbl>, Scaling_Factor <dbl>,
## #   Calculated.Total.Protein..ug.L. <dbl>,
## #   Scaled.Corrected.Exclusive.Sum <dbl>, blast.accession <chr>,
## #   blast.best.hit.taxon.id <dbl>, KO <chr>, Group <chr>, Domain <chr>,
## #   Phylum <chr>, Class <chr>, Order <chr>, Family <chr>, Genus <chr>,
## #   Species <chr>, LCA.Group <chr>, LCA.Domain <chr>, LCA.Phylum <chr>, ...
```

```
ggplot(VirusData, aes(x = Scaled.Corrected.Exclusive.Sum)) +
  geom_histogram(binwidth = 0.5, fill = "lightblue", color = "black") +
  labs(title = "Distribution of ScaleCorrectedExclusiveSum", x = "Exclusive Sum", y = "Frequency") +
  theme_minimal()
```



Boxplot: Show spread and outliers for a variable.

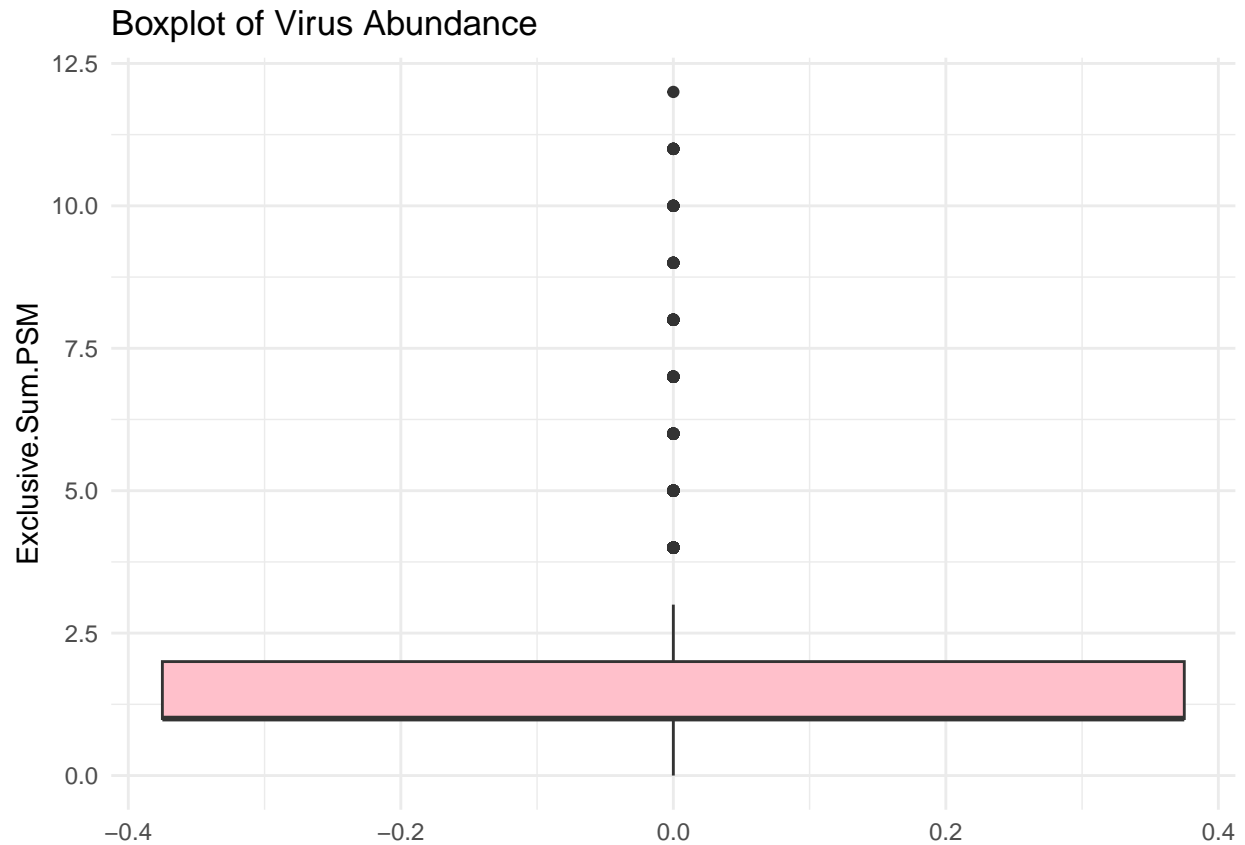
```
library(ggplot2)
library(dplyr)
VirusData <- read_csv("pt 2/VirusProteomz.csv")
```

```
## Rows: 2649 Columns: 60
## -- Column specification -----
## Delimiter: ","
## chr (42): MS.MS.sample.name, DepthGroup, Region, Peptide.sequence, Protein.n...
## dbl (17): z, Stn, Depth.m., Longitude, Latitude, Exclusive.Sum.PSM, Scaling_...
## lgl (1): SOM.Label.Flag
##
## i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.
```

```
head(VirusData)
```

```
## # A tibble: 6 x 60
##       z MS.MS.sample.name      Stn Depth.m. Longitude Latitude DepthGroup Region
##   <dbl> <chr>                <dbl>   <dbl>    <dbl>    <dbl> <chr>    <chr>
## 1     1 170825_proteOMZ_2D_~     10     20    -140      8 Surface  South
## 2     2 170825_proteOMZ_2D_~     10     20    -140      8 Surface  South
## 3     3 170825_proteOMZ_2D_~     10     20    -140      8 Surface  South
## 4     4 170825_proteOMZ_2D_~     10     20    -140      8 Surface  South
## 5     5 170825_proteOMZ_2D_~     10     20    -140      8 Surface  South
## 6     6 170825_proteOMZ_2D_~     10     20    -140      8 Surface  South
## # i 52 more variables: Peptide.sequence <chr>, Protein.name <chr>,
## #   Exclusive.Sum.PSM <dbl>, Scaling_Factor <dbl>,
## #   Calculated.Total.Protein..ug.L. <dbl>,
## #   Scaled.Corrected.Exclusive.Sum <dbl>, blast.accession <chr>,
## #   blast.best.hit.taxon.id <dbl>, KO <chr>, Group <chr>, Domain <chr>,
## #   Phylum <chr>, Class <chr>, Order <chr>, Family <chr>, Genus <chr>,
## #   Species <chr>, LCA.Group <chr>, LCA.Domain <chr>, LCA.Phylum <chr>, ...
```

```
ggplot(VirusData, aes(y = Exclusive.Sum.PSM)) +
  geom_boxplot(fill = "pink") +
  labs(title = "Boxplot of Virus Abundance", y = "Exclusive.Sum.PSM") +
  theme_minimal()
```



Boxplot: Show Family level abundance by Stn group.

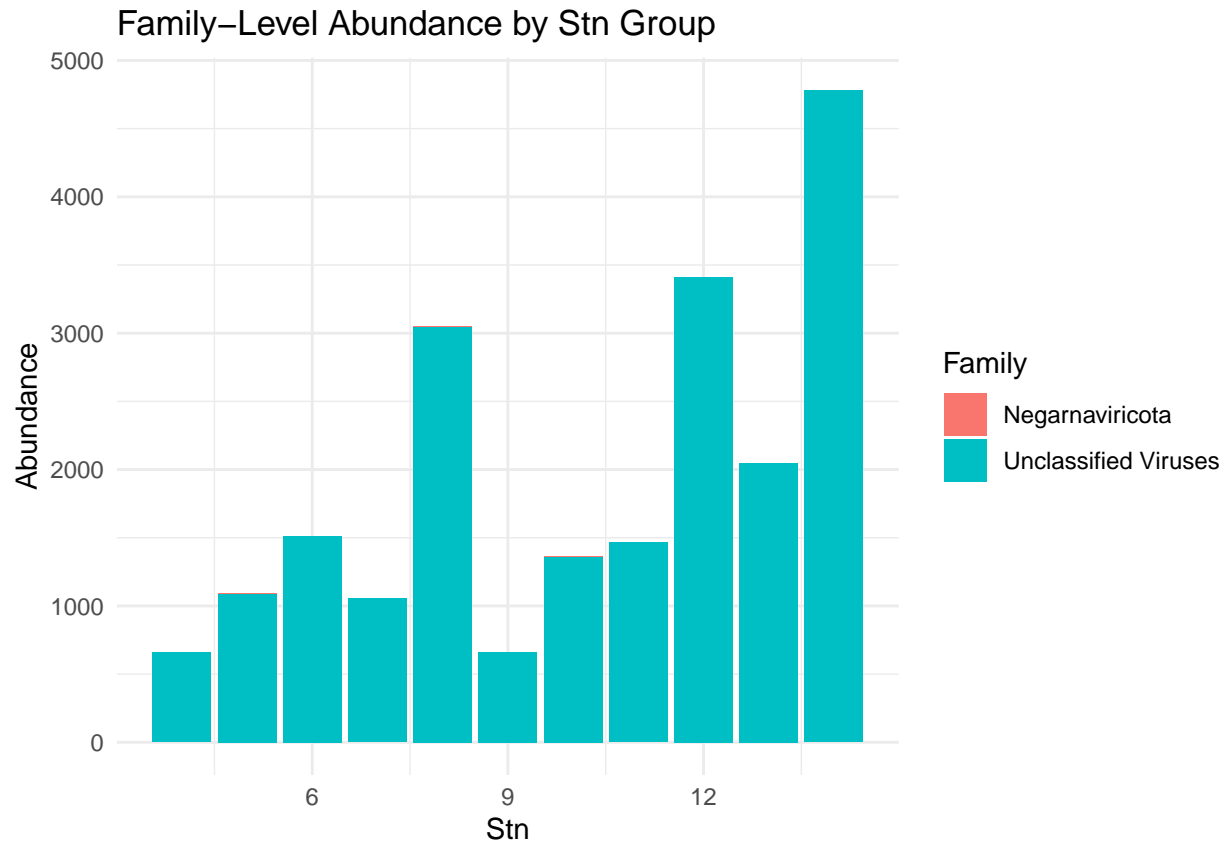
```
library(ggplot2)
library(readr)

# Remove rows with missing values in key columns
cleaned_data <- VirusData[!is.na(VirusData$Family) & !is.na(VirusData$Stn), ]

# Aggregate data by DepthGroup and Family
taxa_abundance <- aggregate(cleaned_data$Scaled.Corrected.Exclusive.Sum,
                             by = list(Stn = cleaned_data$Stn, Phylum = cleaned_data$Phylum),
                             FUN = sum)

# Rename columns
colnames(taxa_abundance) <- c("Stn", "Family", "Abundance")

# Plot
ggplot(taxa_abundance, aes(x = Stn, y = Abundance, fill = Family)) +
  geom_bar(stat = "identity", position = "stack") +
  labs(title = "Family-Level Abundance by Stn Group", x = "Stn", y = "Abundance") +
  theme_minimal()
```



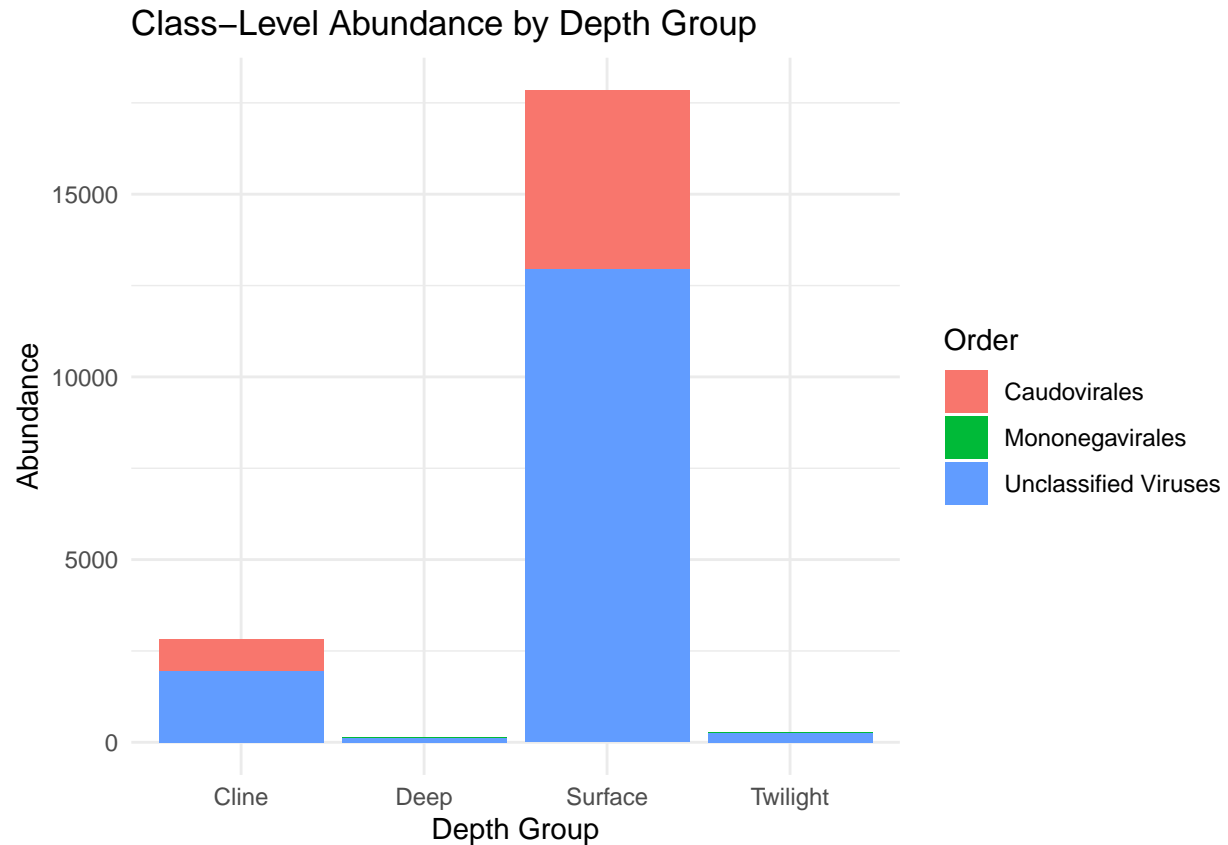
Boxplot: Show Order level abundance by depth group.

```
library(ggplot2)
library(readr)

# Aggregate data by DepthGroup and Order
taxa_abundance_order <- aggregate(cleaned_data$Scaled.Corrected.Exclusive.Sum,
                                   by = list(DepthGroup = cleaned_data$DepthGroup, Order = cleaned_data$Order),
                                   FUN = sum)

# Rename columns
colnames(taxa_abundance_order) <- c("DepthGroup", "Order", "Abundance")

# Plot
ggplot(taxa_abundance_order, aes(x = DepthGroup, y = Abundance, fill = Order)) +
  geom_bar(stat = "identity", position = "stack") +
  labs(title = "Class-Level Abundance by Depth Group", x = "Depth Group", y = "Abundance") +
  theme_minimal()
```



Boxplot: Show Order taxa abundance by Class group.

```
library(readr)
library(ggplot2)
VirusData <- read_csv("pt 2/VirusProteomz.csv")

## Rows: 2649 Columns: 60
## -- Column specification -----
## Delimiter: ","
## chr (42): MS.MS.sample.name, DepthGroup, Region, Peptide.sequence, Protein.n...
## dbl (17): z, Stn, Depth.m., Longitude, Latitude, Exclusive.Sum.PSM, Scaling...
## lgl (1): SOM.Label.Flag
##
## i Use 'spec()' to retrieve the full column specification for this data.
## i Specify the column types or set 'show_col_types = FALSE' to quiet this message.
```

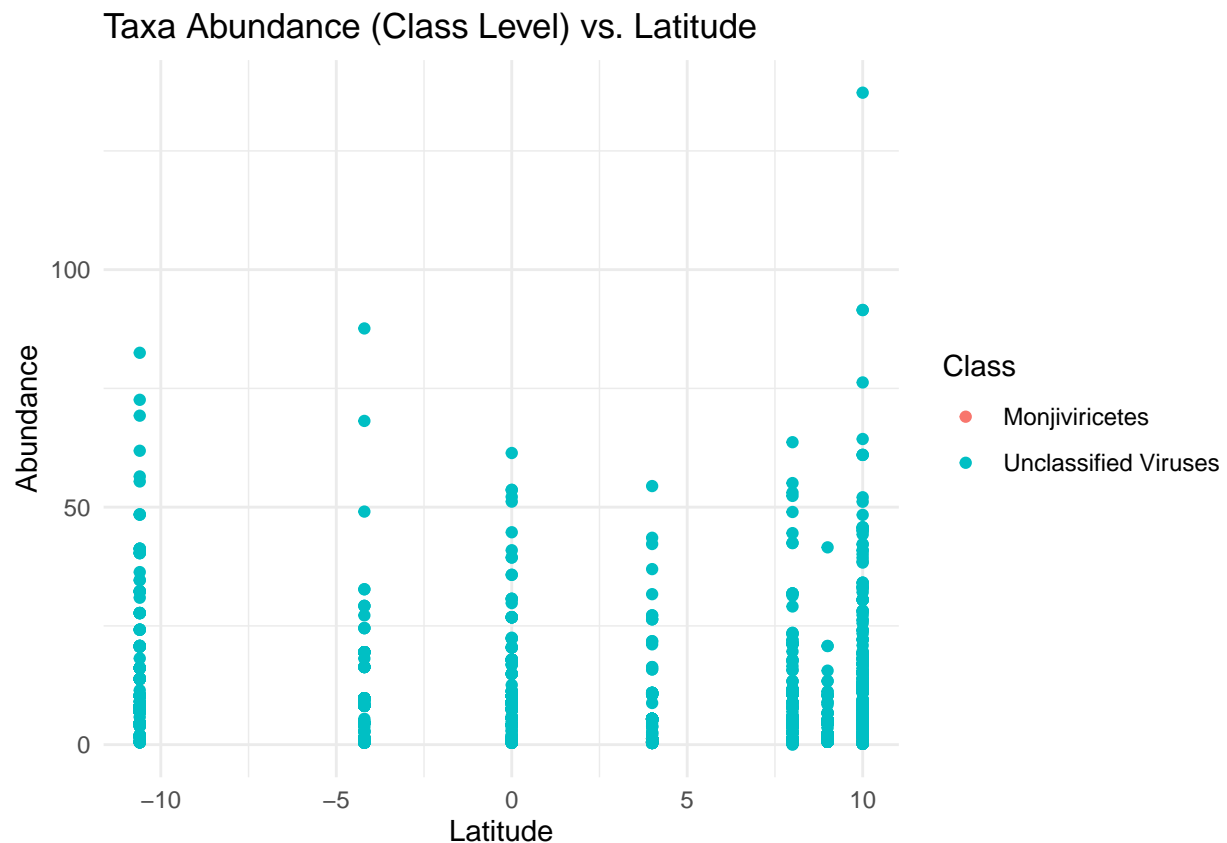
```
head(VirusData)

## # A tibble: 6 x 60
##       z MS.MS.sample.name      Stn Depth.m. Longitude Latitude DepthGroup Region
##   <dbl> <chr>                <dbl>   <dbl>   <dbl>   <dbl> <chr>    <chr>
## 1     1 170825_proteOMZ_2D_~     10     20    -140      8 Surface  South
```

```
## 2      2 170825_proteOMZ_2D_~    10      20      -140      8 Surface    South
## 3      3 170825_proteOMZ_2D_~    10      20      -140      8 Surface    South
## 4      4 170825_proteOMZ_2D_~    10      20      -140      8 Surface    South
## 5      5 170825_proteOMZ_2D_~    10      20      -140      8 Surface    South
## 6      6 170825_proteOMZ_2D_~    10      20      -140      8 Surface    South
## # i 52 more variables: Peptide.sequence <chr>, Protein.name <chr>,
## #   Exclusive.Sum.PSM <dbl>, Scaling_Factor <dbl>,
## #   Calculated.Total.Protein..ug.L. <dbl>,
## #   Scaled.Corrected.Exclusive.Sum <dbl>, blast.accession <chr>,
## #   blast.best.hit.taxon.id <dbl>, KO <chr>, Group <chr>, Domain <chr>,
## #   Phylum <chr>, Class <chr>, Order <chr>, Family <chr>, Genus <chr>,
## #   Species <chr>, LCA.Group <chr>, LCA.Domain <chr>, LCA.Phylum <chr>, ...
```

```
ggplot(cleaned_data, aes(x = Latitude, y = Scaled.Corrected.Exclusive.Sum, color = Class)) +
  geom_point() +
  labs(title = "Taxa Abundance (Class Level) vs. Latitude", x = "Latitude", y = "Abundance") +
  theme_minimal()
```

```
## Warning: Removed 24 rows containing missing values or values outside the scale range
## ('geom_point()').
```



Conclusion

In this notebook, we have demonstrated various R functionalities from basic operations to advanced analyses on virus data. We started with basic data structures and operations, moved on to data cleaning and exploratory data analysis, and finally performed advanced analyses such as regression and clustering. Future work could include more sophisticated modeling and validation techniques to further understand the virus data.